

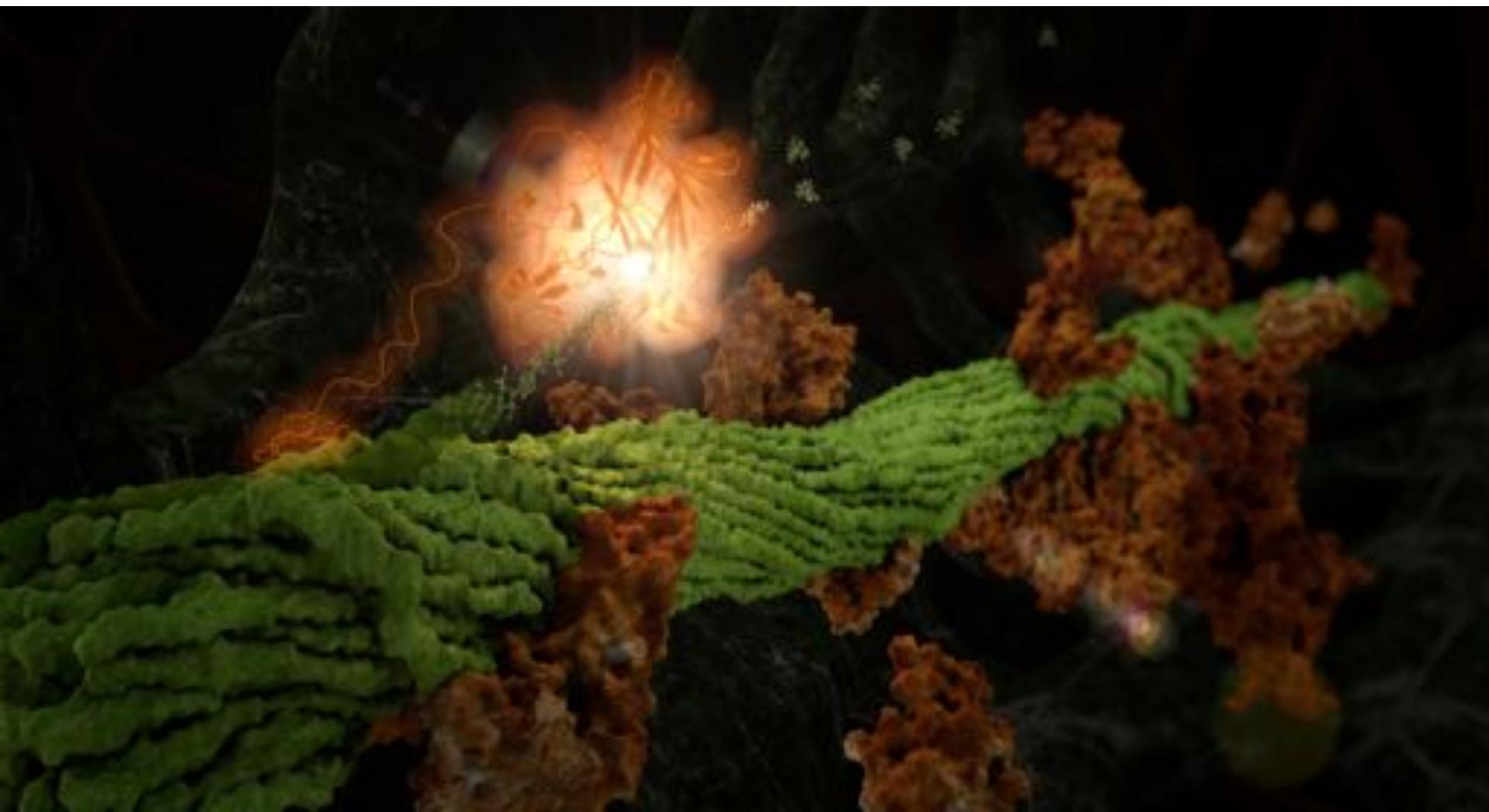


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Molecular  
Biophysics

# Supercomputing in Biology and Medicine



Jeremy C. Smith





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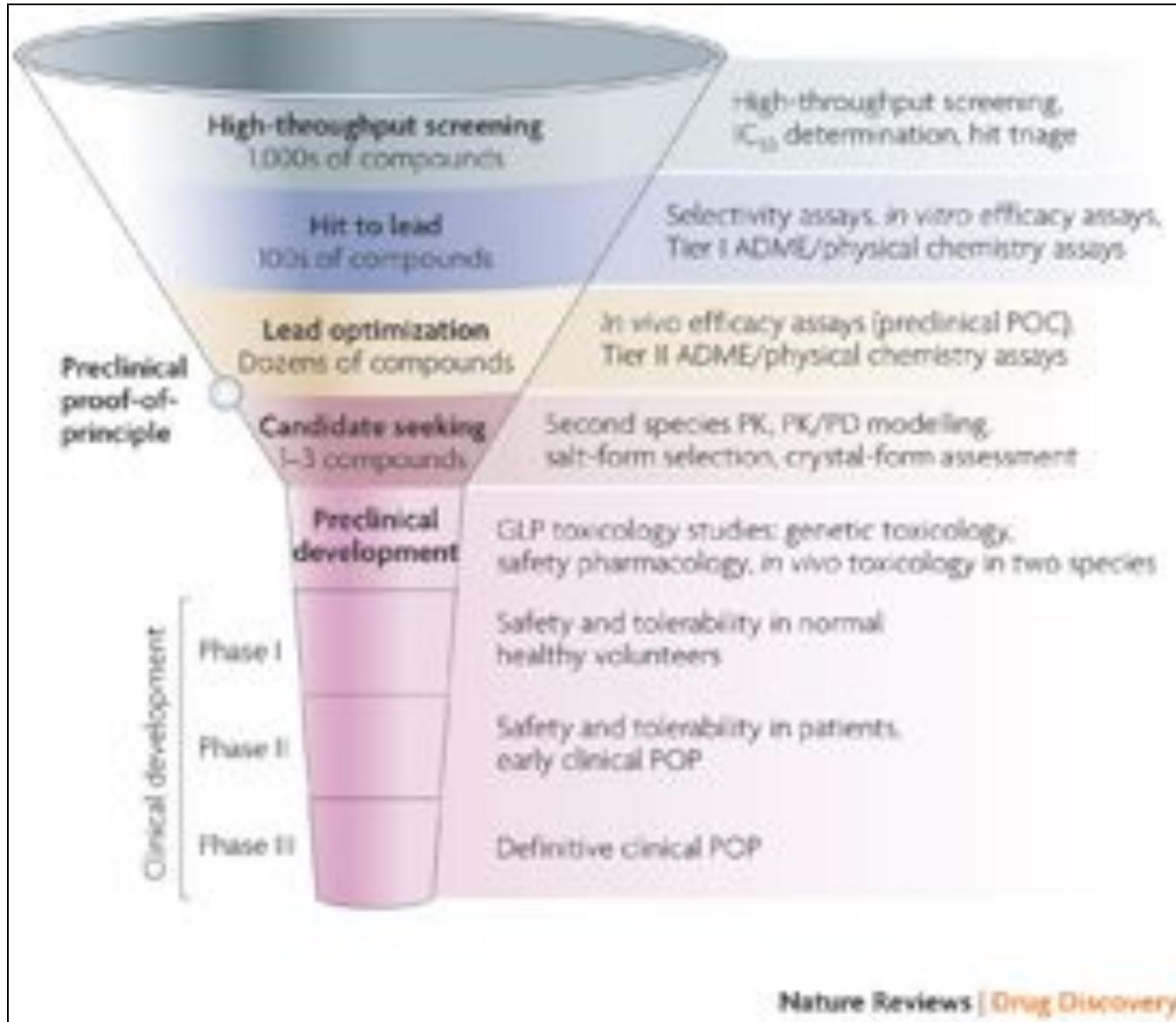


## **Drug Discovery**

**Large-Scale  
Molecular Dynamics Simulation**

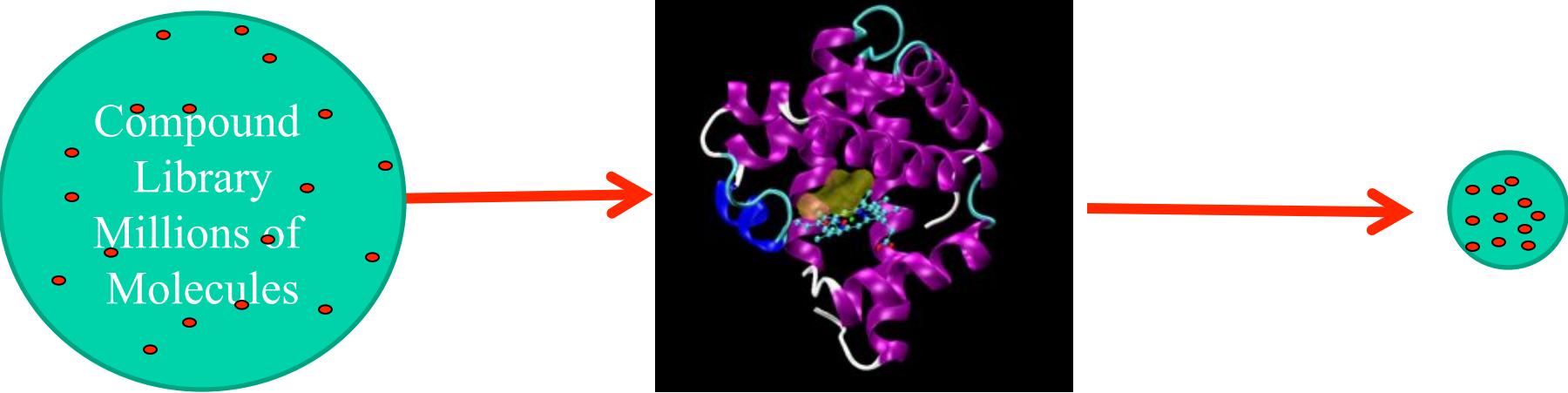


# Drug Discovery





## Structure-based Computational Drug Discovery



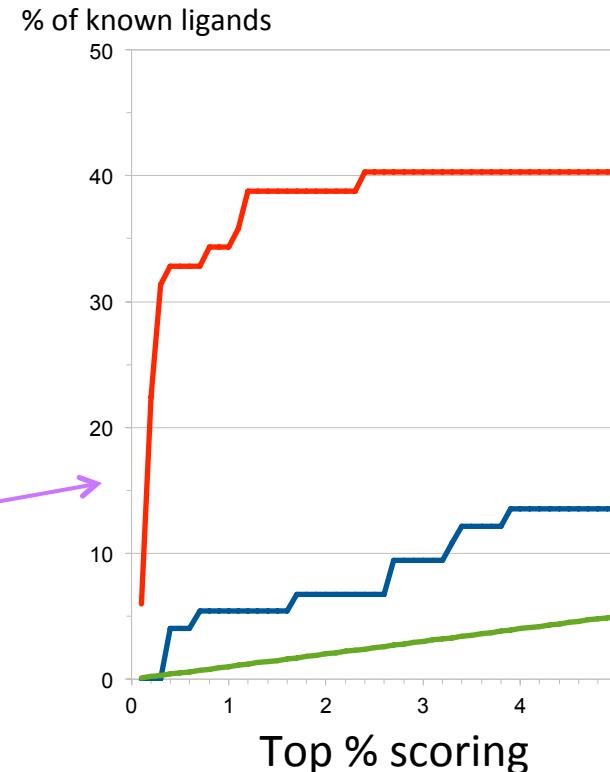
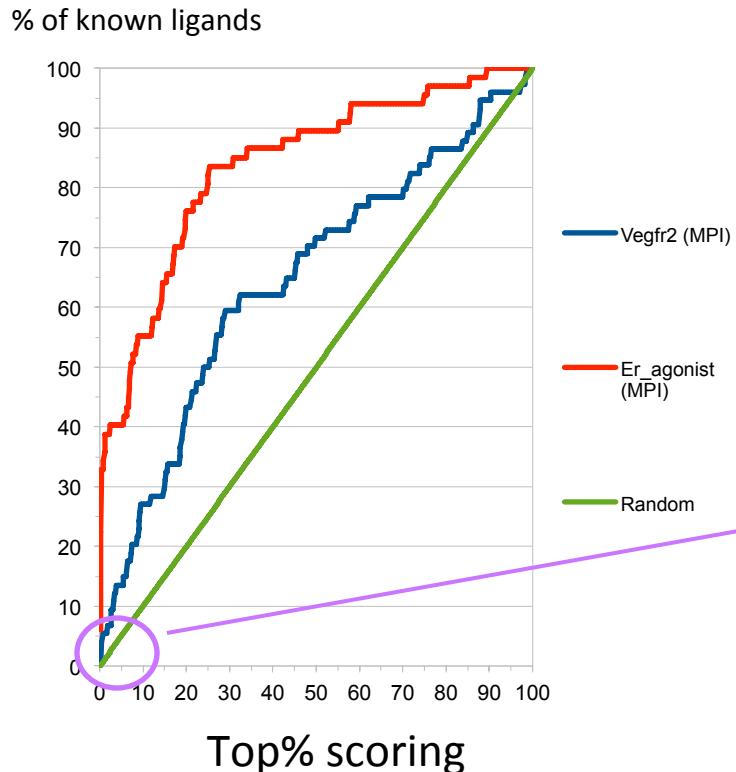
Enrich a collection of compounds with molecules most likely to bind to the drug target(s)

→ much faster, much more affordable hit & lead discovery



# Hit Enrichment

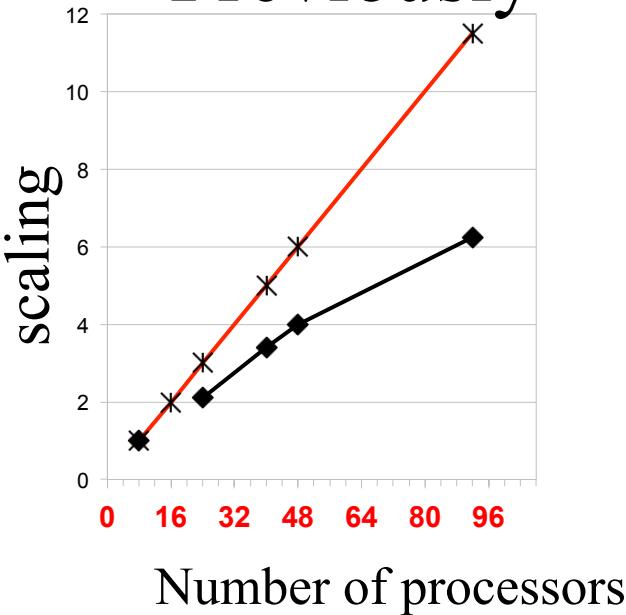
TEST: 98,163 compound database, 2 drug targets:  
ER: 67 known ligands ; VEGFr2: 74 known ligands



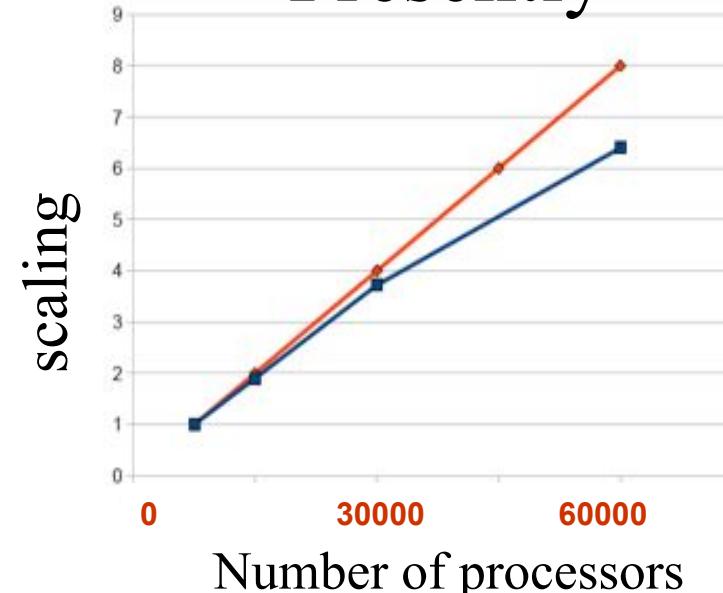
ER: Top 0.3 % of total database (295 candidates, 31 hits): Enrichment =  $\sim 104$   
VEGFr2: Top 0.4 % of total database (393 candidates, 4 hits): Enrichment =  $10$



# Previously



# Presently

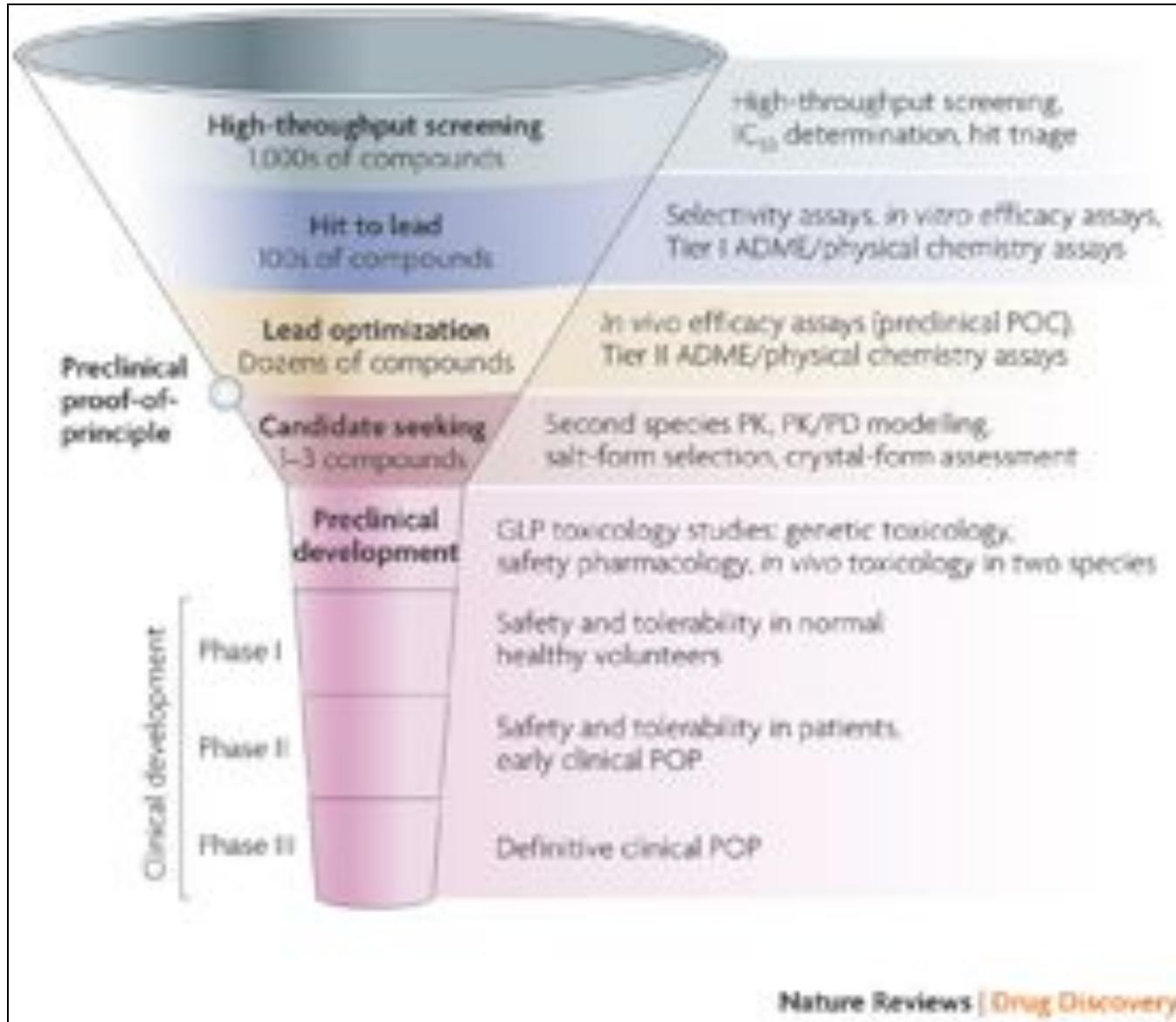


Previously :  
Presently :

1 protein  $10^4$  ligands      ~days  
1 protein  $10^7$  ligands      1 day

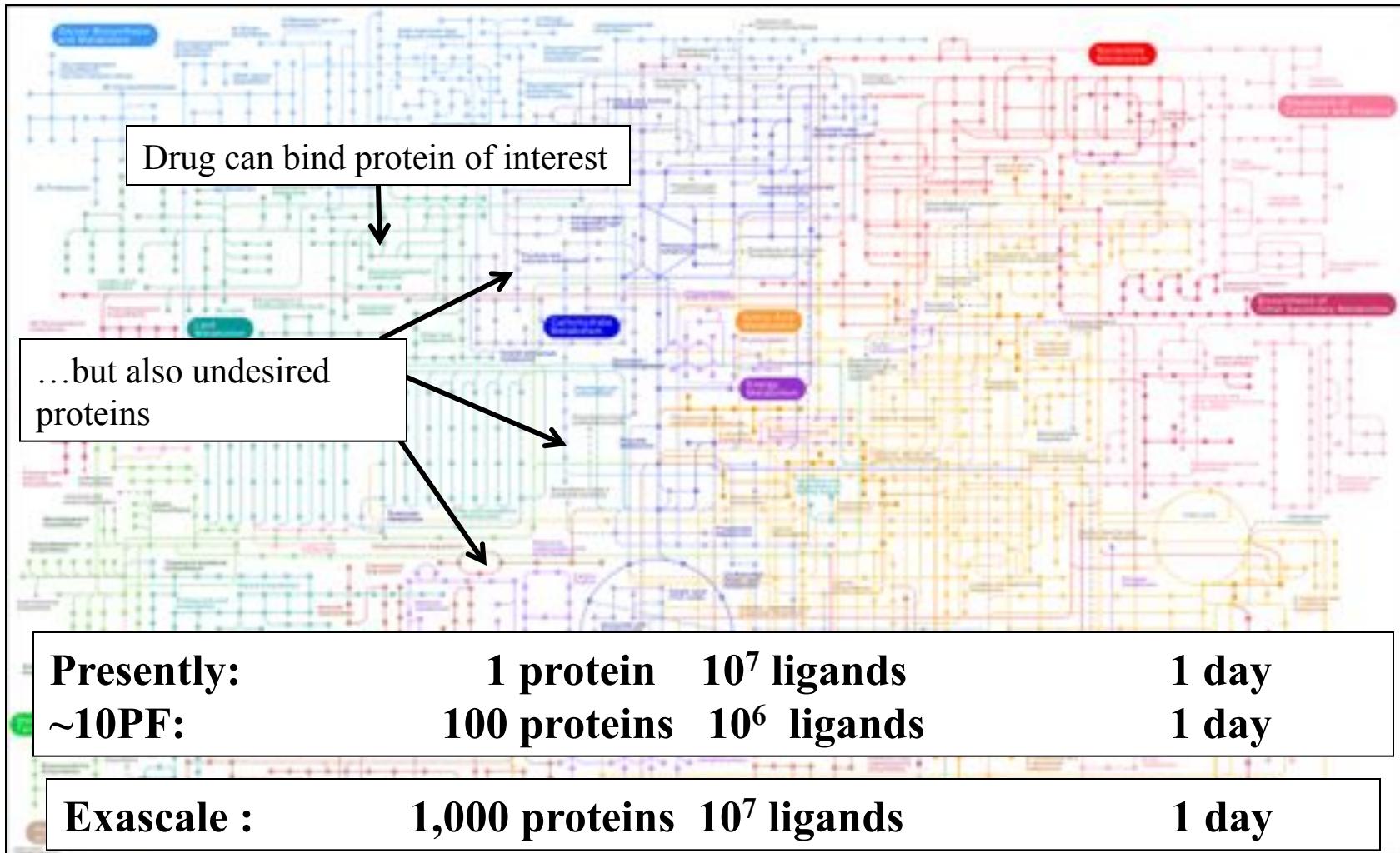


# Drug Discovery





# 10-100 Petaflops: Drugome Exploration, Drug Toxicity, Repurposing





# Cellulosic Ethanol

Hydrolysis

Fermentation

Fuel

Breakdown  
into sugars

**RECALCITRANCE!**



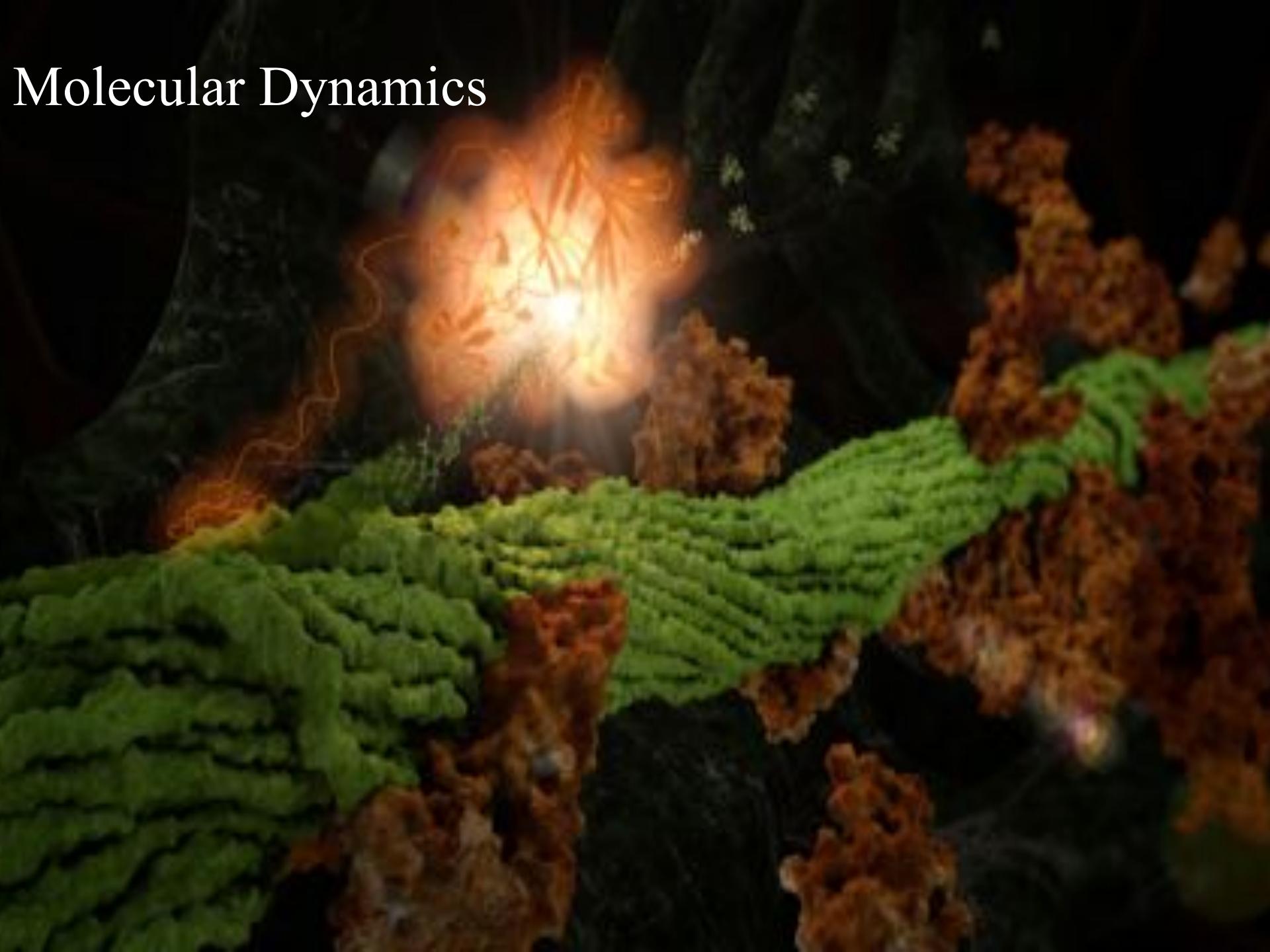
Cellulosic  
Biomass



Strong  
Fermentation  
Tradition in TN!

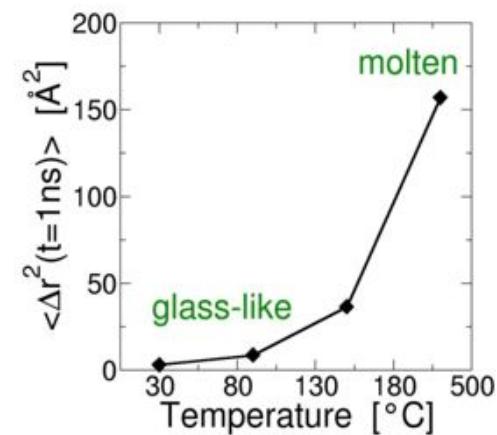
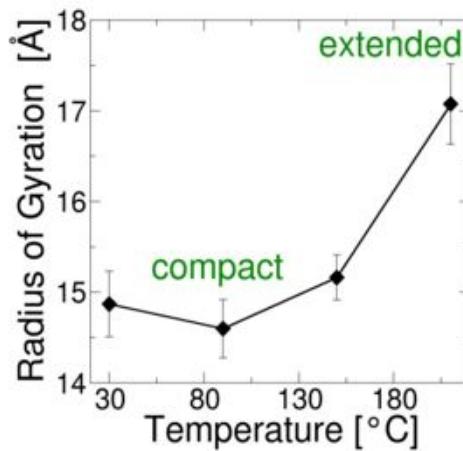
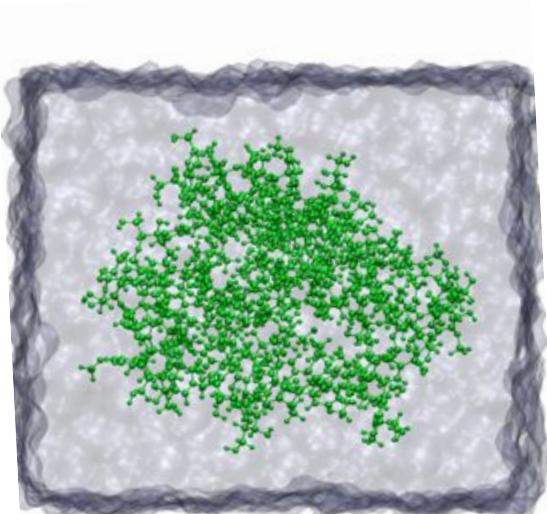


# Molecular Dynamics





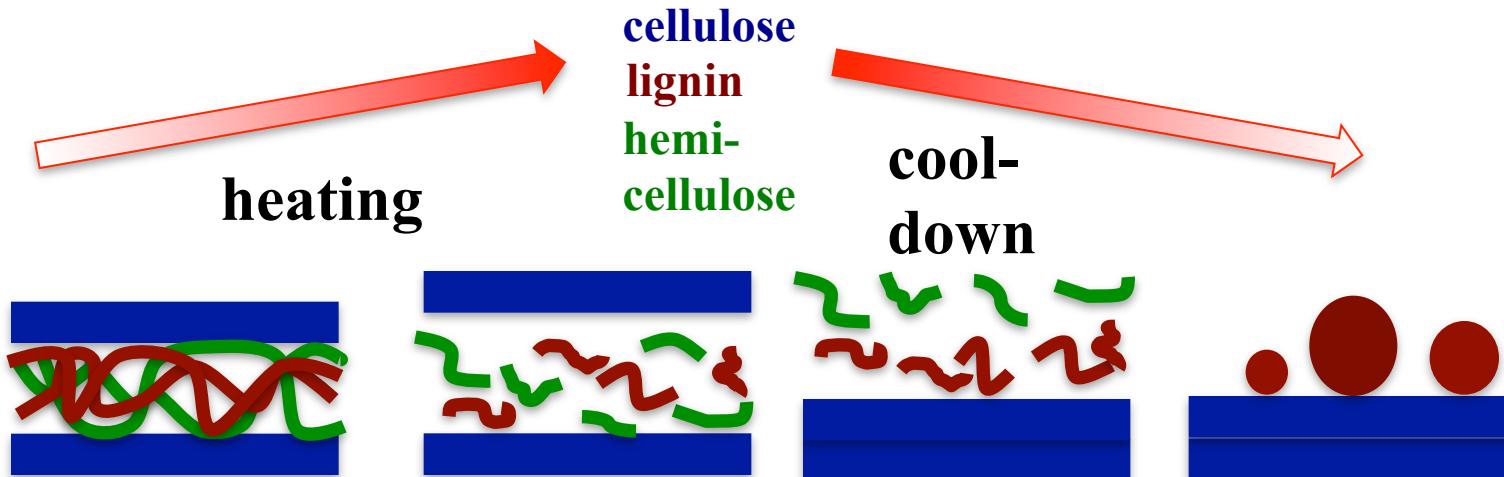
## DOE INCITE: MD Simulation of Softwood Lignin



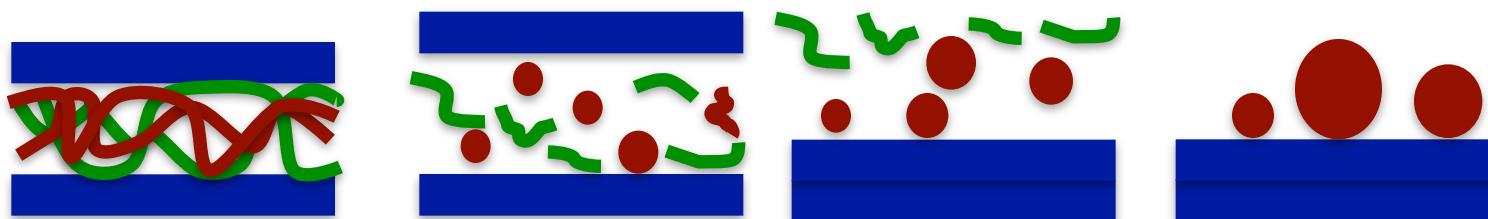
Petridis et al JACS 133 20277 (2011)



# Lignin Aggregation During Heating Phase of Dilute-acid Pretreatment



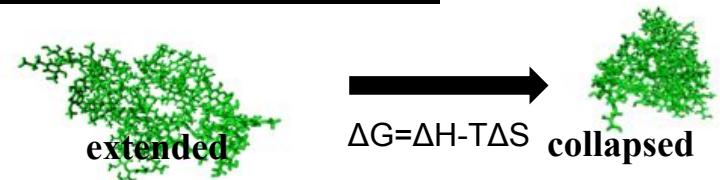
aggregation occurs during cool-down



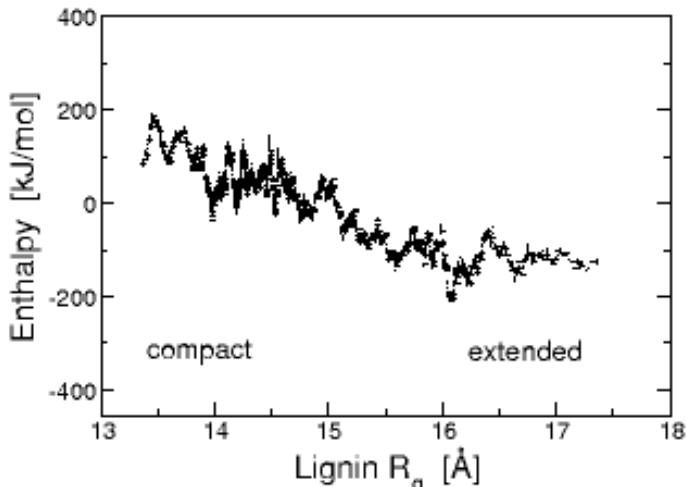
aggregation occurs during heating



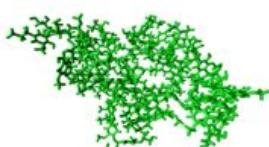
# Why does Lignin Collapse at Room Temperature?



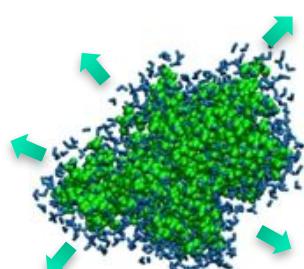
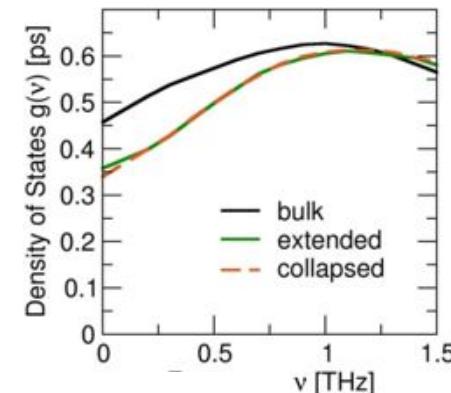
- Enthalpy
- $\Delta H \approx +200 \text{ kJ/mol}$  **Unfavorable**



- Lignin configurational entropy
- $-T\Delta S_{\text{conf}} \approx +10 \text{ kJ/mol}$  **Unfavorable**



- Hydration water translational & rotational entropy
- $-T\Delta S_{t+r} \approx -100 \text{ kJ/mol}$  **Favorable**



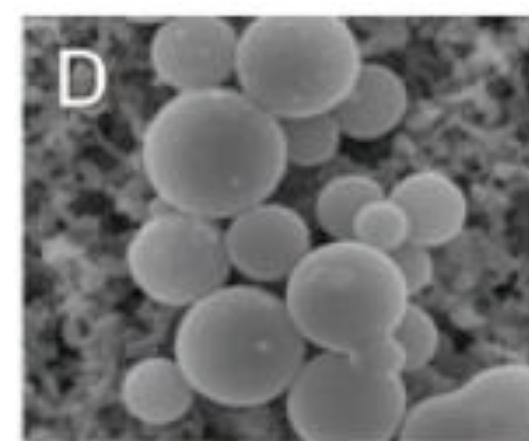
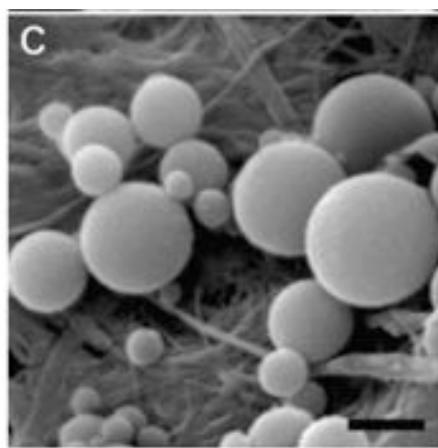
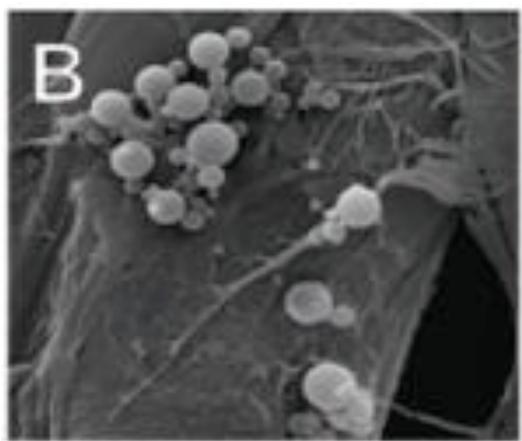
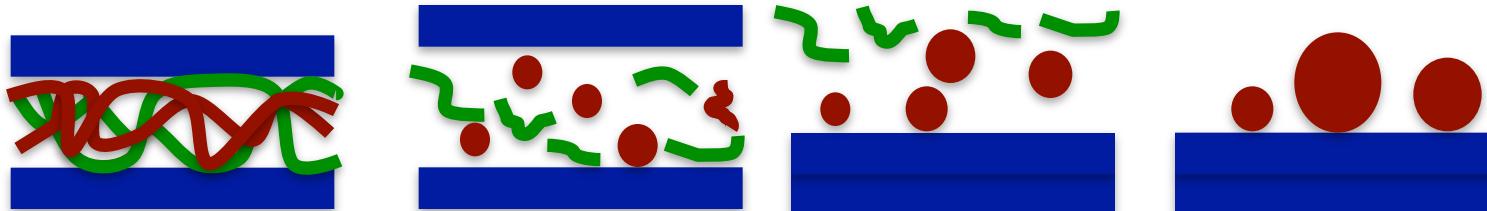
- Hydration water compressibility
- $-T\Delta S_{\text{fluc}} \approx -300 \text{ kJ/mol}$  **Favorable**

**Collapse Driven by Removal of Entropically Unfavorable Water Molecules from Lignin Surface to Bulk**



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# Biomass Pretreatment

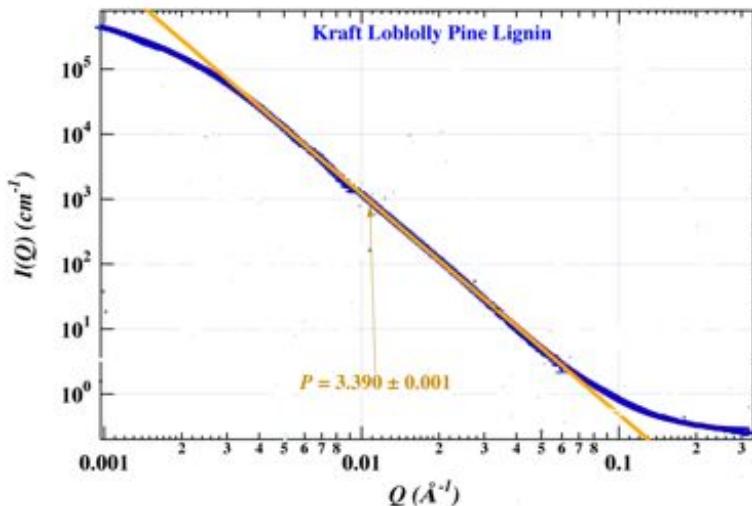


Are Lignin Aggregates Spheres?

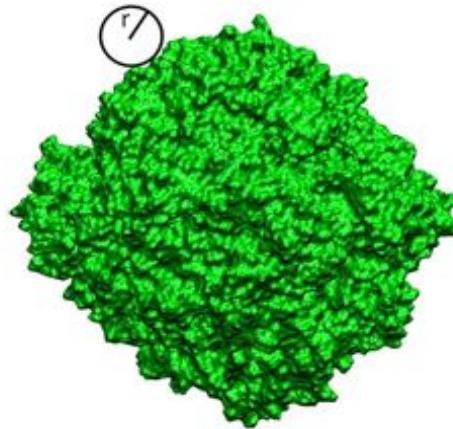


## Small-Angle Neutron Scattering

$$S(q) \propto Q^{d_s - 6}$$

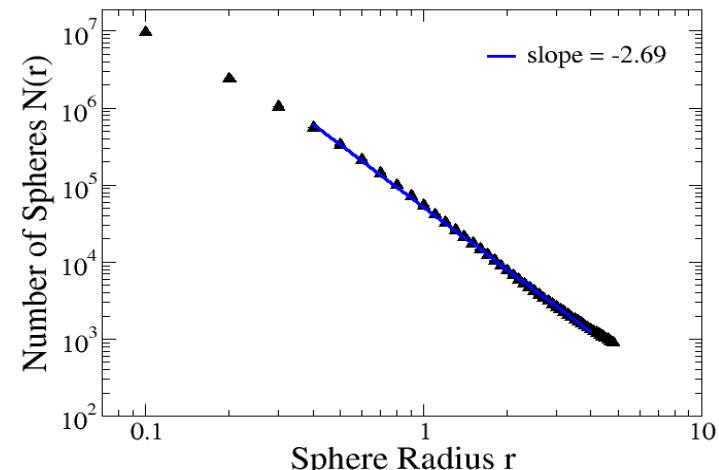


$$d_s = 2.62 \pm 0.02$$



## Molecular Dynamics

$$N(r) = r^{-d_s}$$



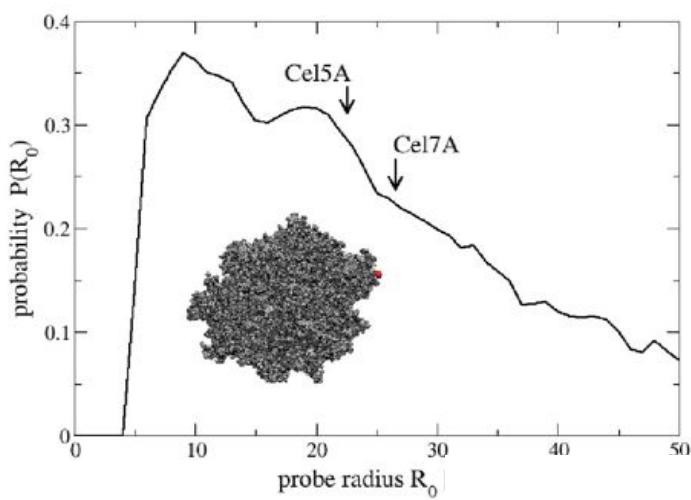
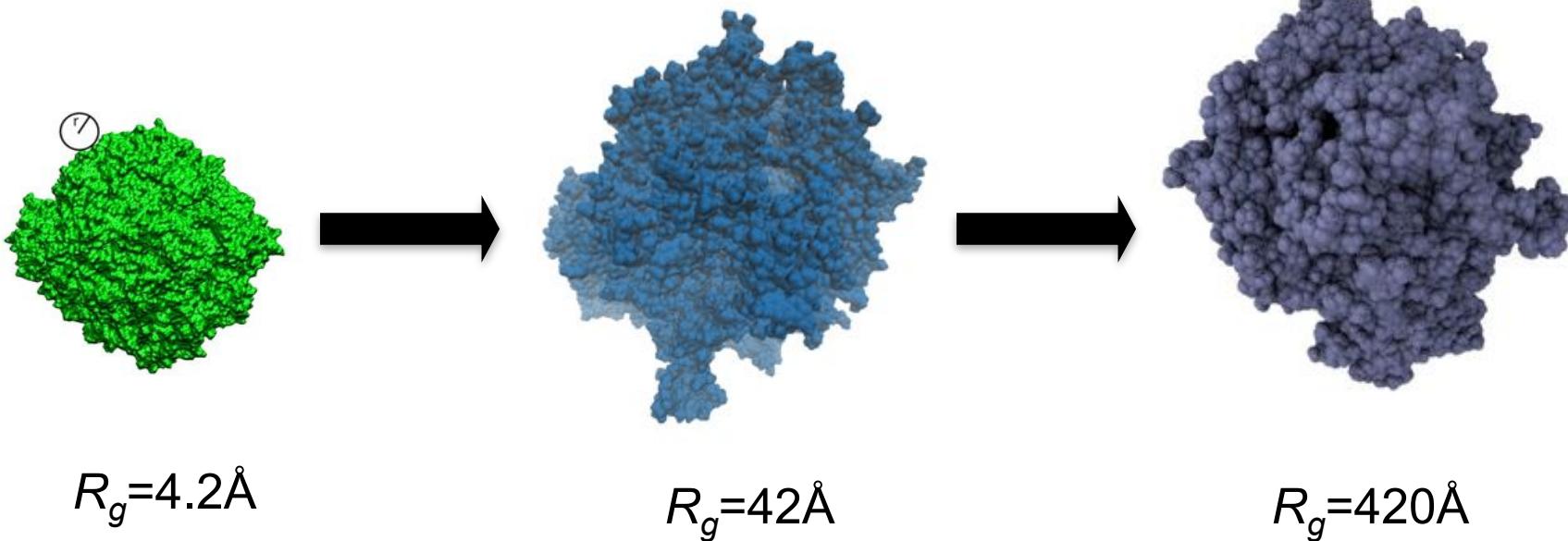
$$d_s = 2.65 \pm 0.01$$



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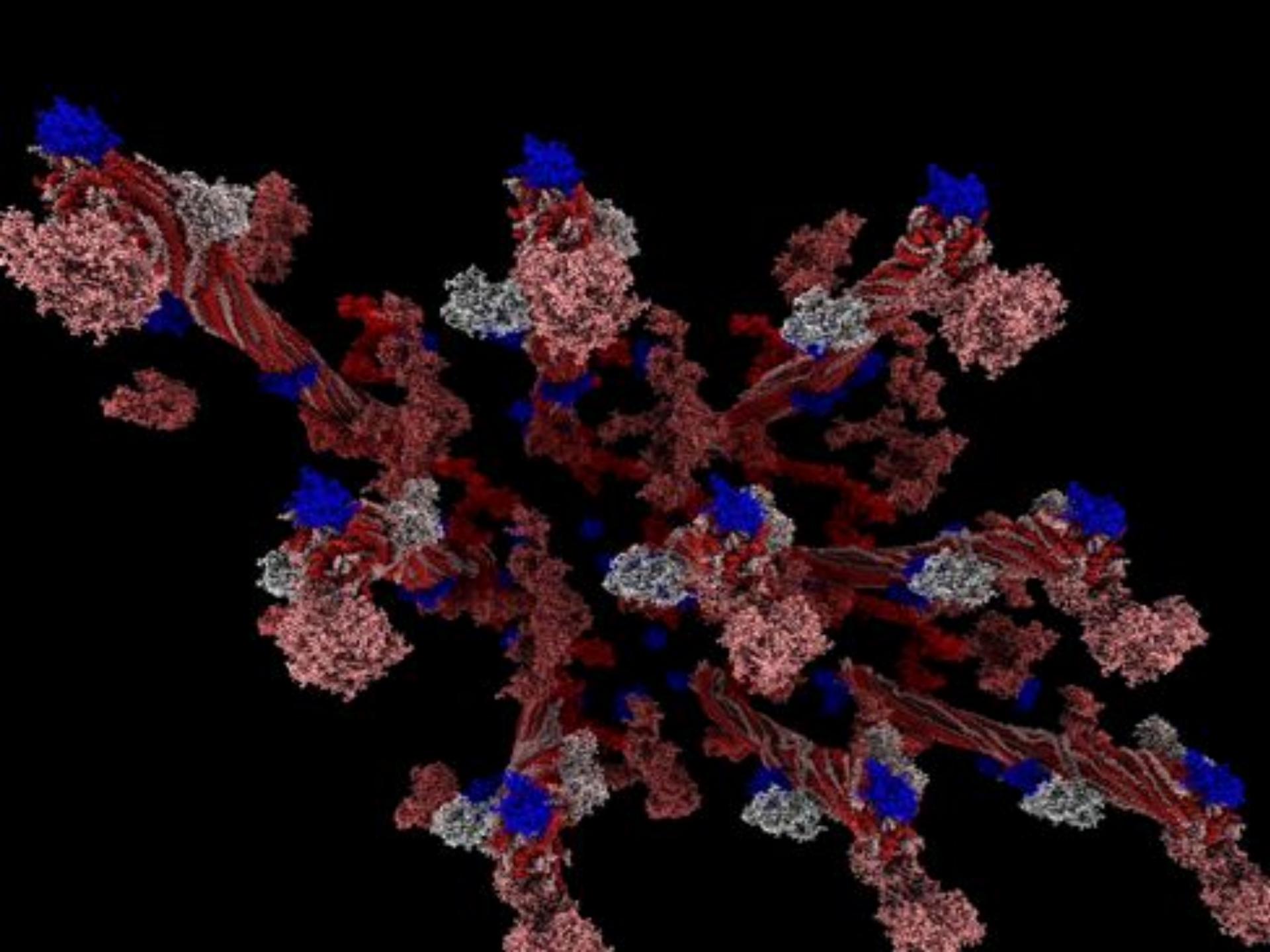
\* ORNL

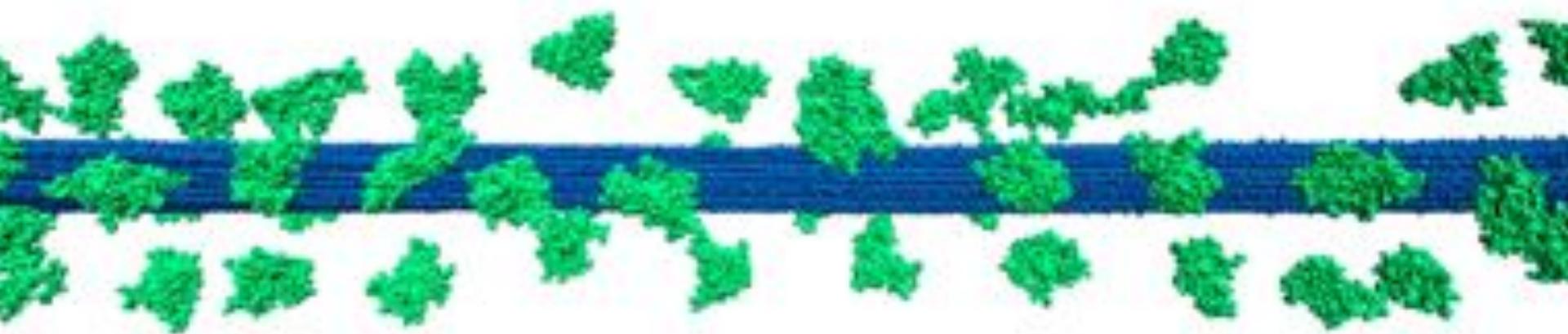
# Surface Fractals over Three Orders of Magnitude

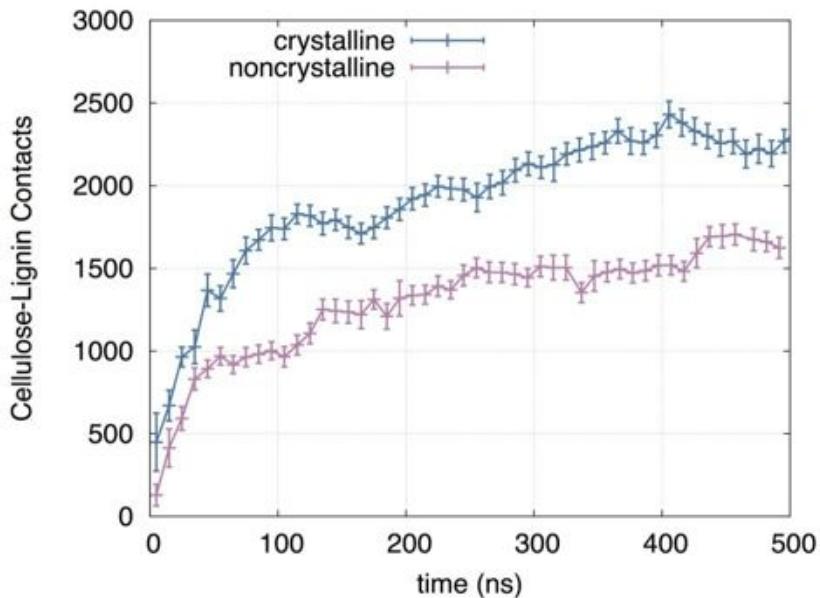


Enzyme:lignin  
interaction  
distribution

Petridis et al Physical Review E 83(61):061911 (2011)





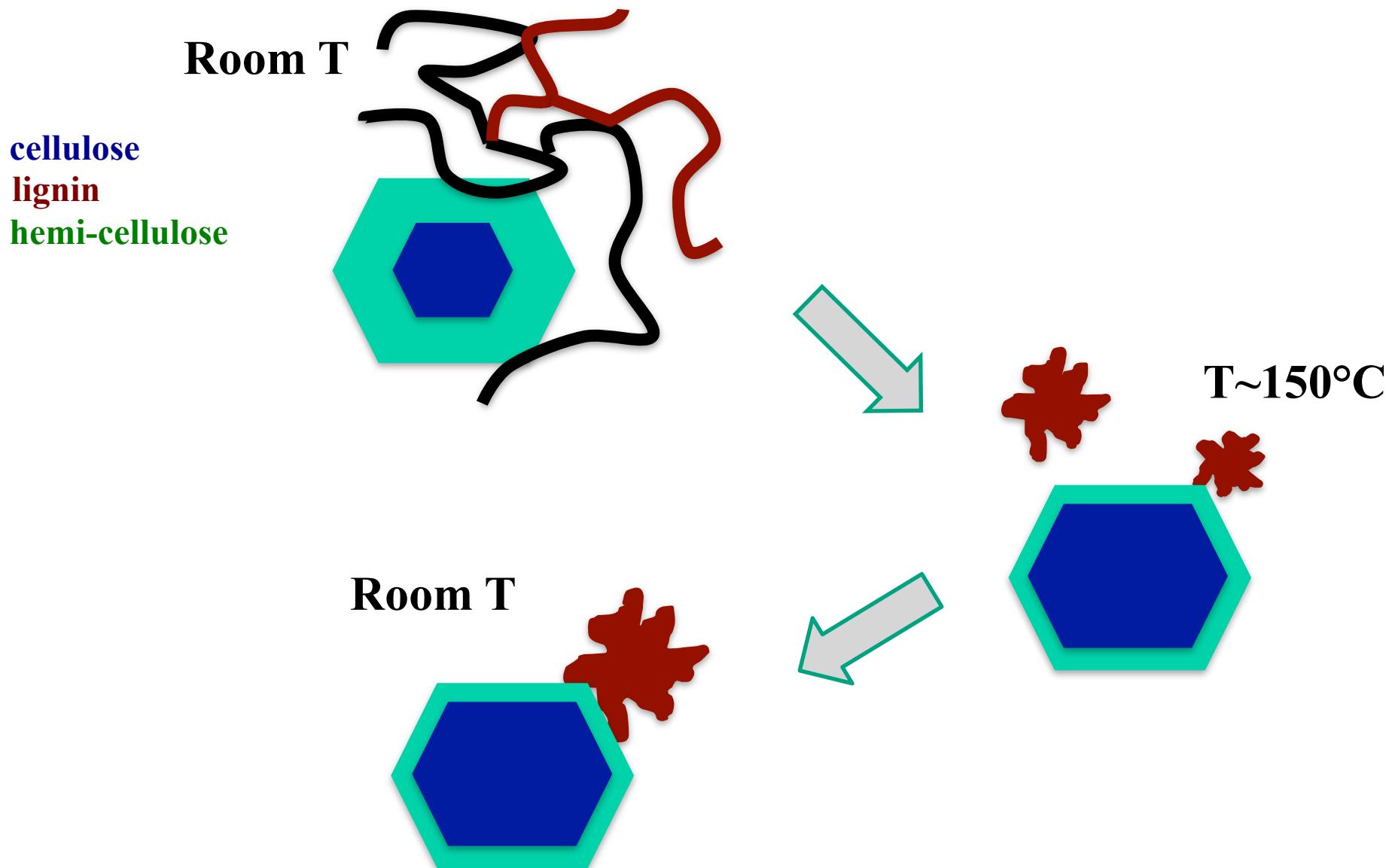


Interface	Interaction Energy Density (kJ/mol/nm <sup>2</sup> )
lignin: crystalline cellulose	-49±2
lignin: non-crystalline cellulose	-50±2
water : crystalline cellulose	-94±2
water : non-crystalline cellulose	-107±2

## Solvent-Driven Preferential Association of Lignin with Crystalline Cellulose

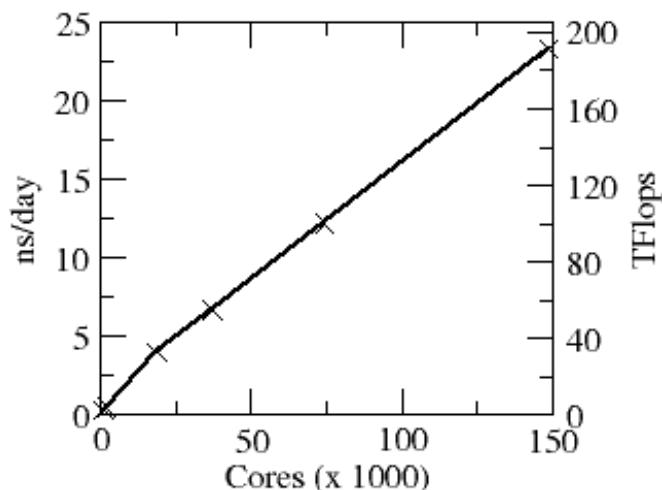


# New View of Pretreatment





## Supercomputer Scaling

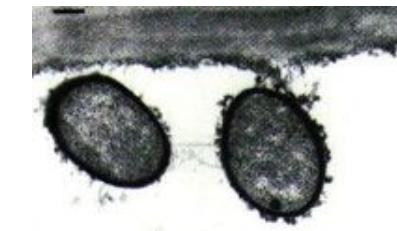


~ 100 million atoms.

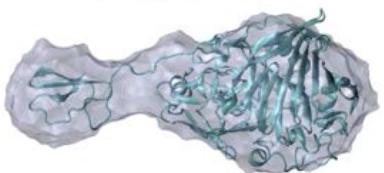
- Scales to 150,000 cores



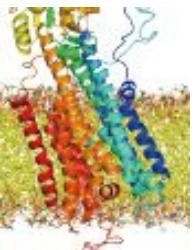
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$1\mu m$



SANS



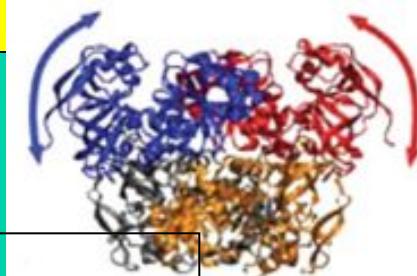
Exascale

10PF

spin echo

Petascale

Cluster



vibrational backscattering

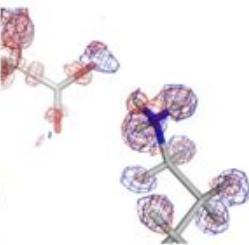
$1 fs$

$1 ps$

$1 ns$

$1 \mu s$

reflectometry



crystallography,  
solution diffraction

# Multiscale Structure and Dynamics

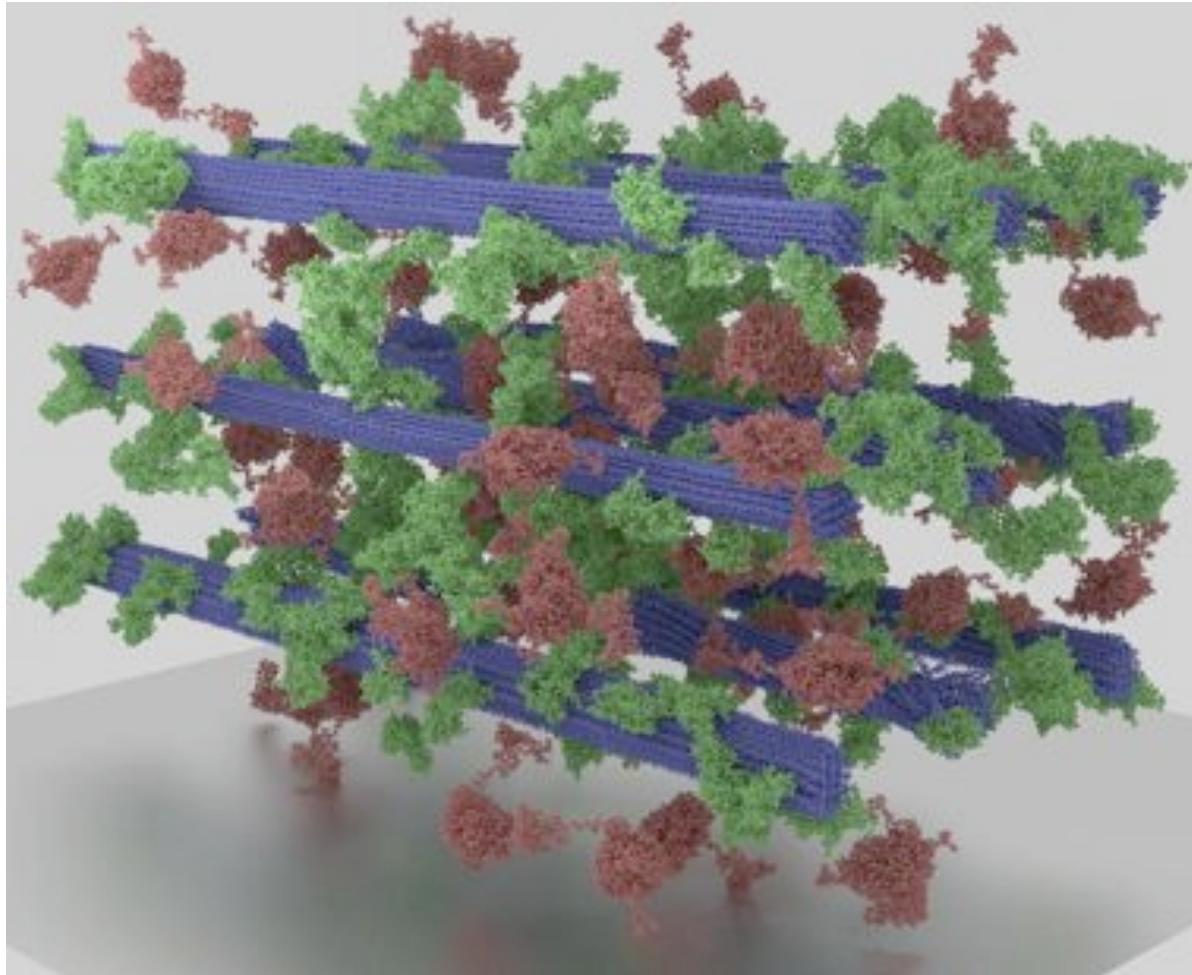




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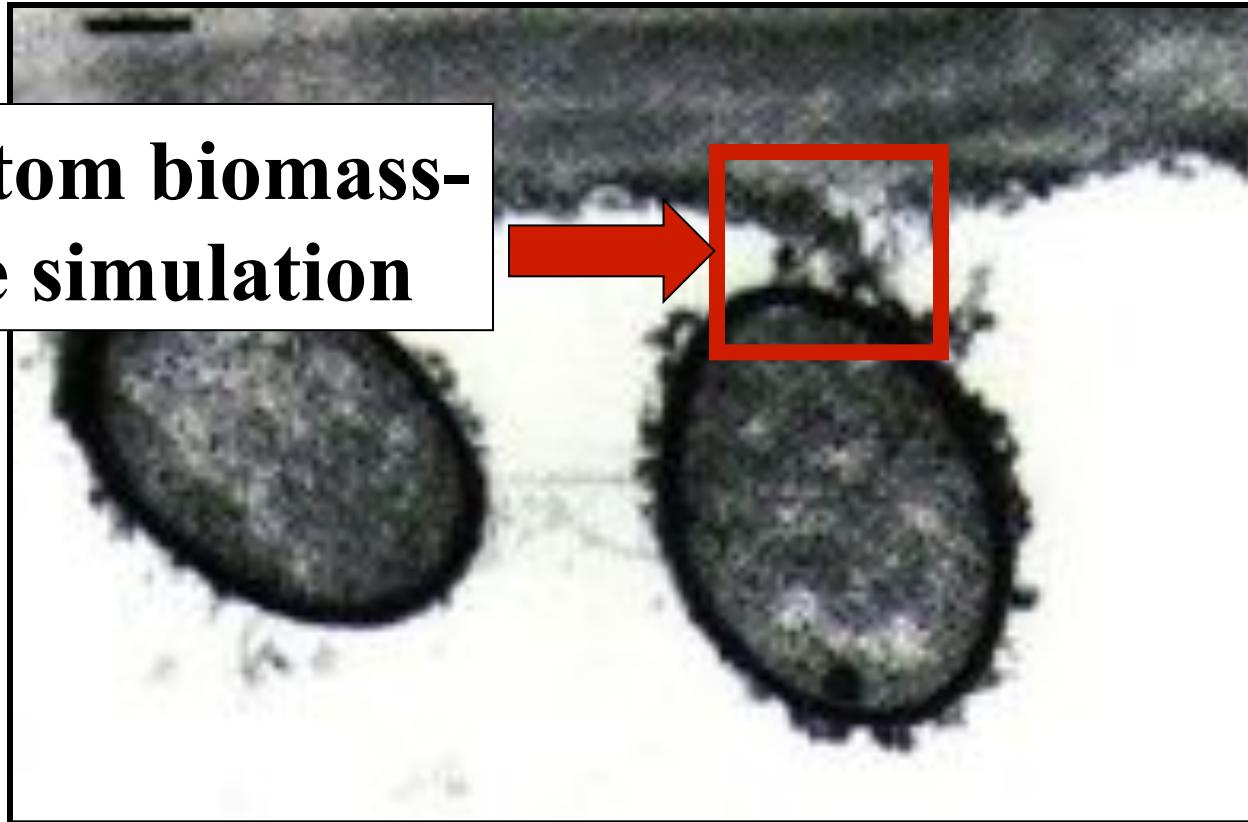
# 24M-atom capability-class simulation of enzyme binding to pretreated lignocellulose



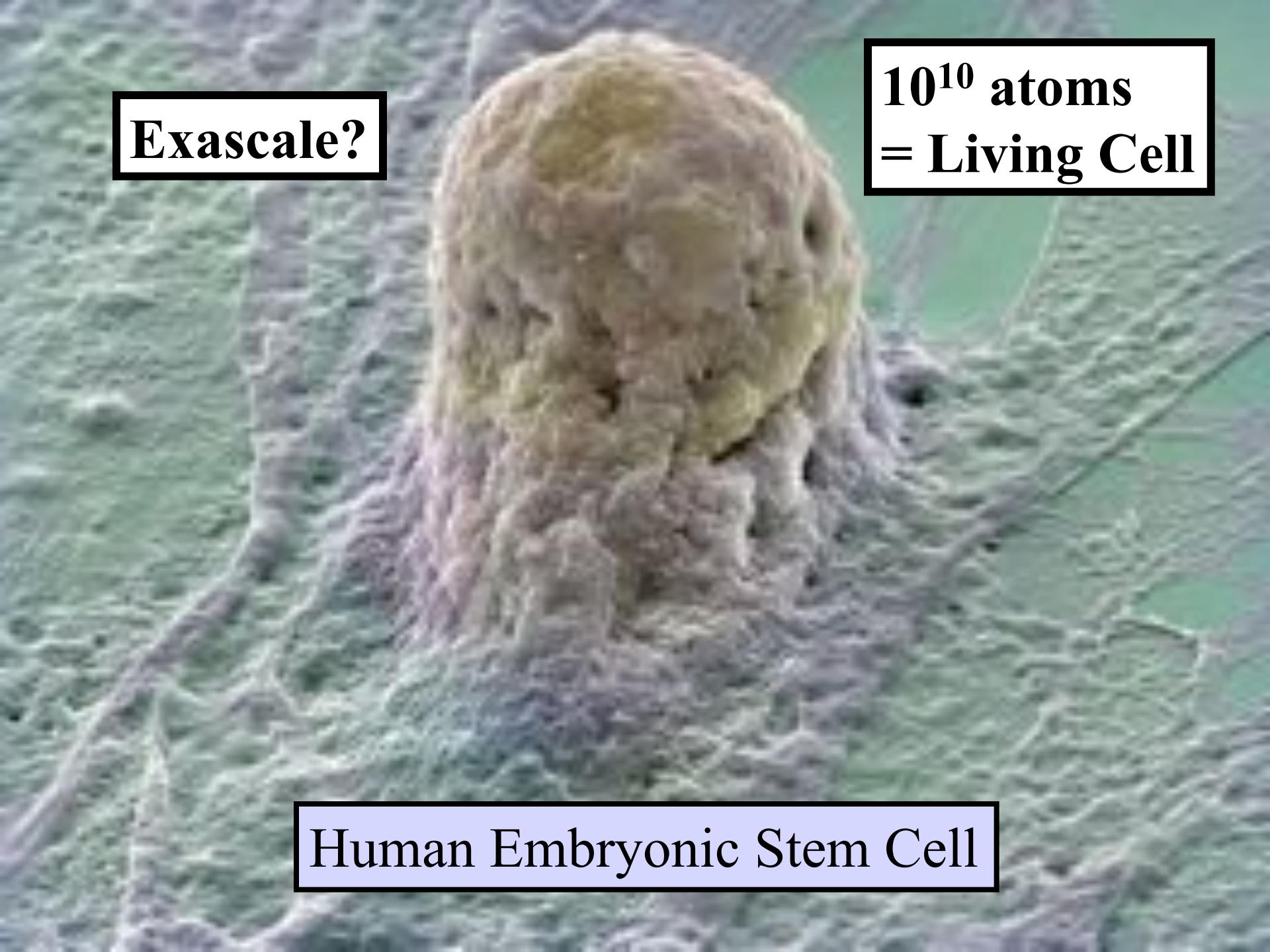


10PF?

300M atom biomass-microbe simulation



Hydrolysis of biomass by *Clostridium thermocellum*

A scanning electron micrograph (SEM) showing a single, large, spherical human embryonic stem cell. The cell has a light-colored, textured surface and is surrounded by a layer of smaller, more uniform cells, likely a feeder layer. The background is a dark, textured surface.

Exascale?

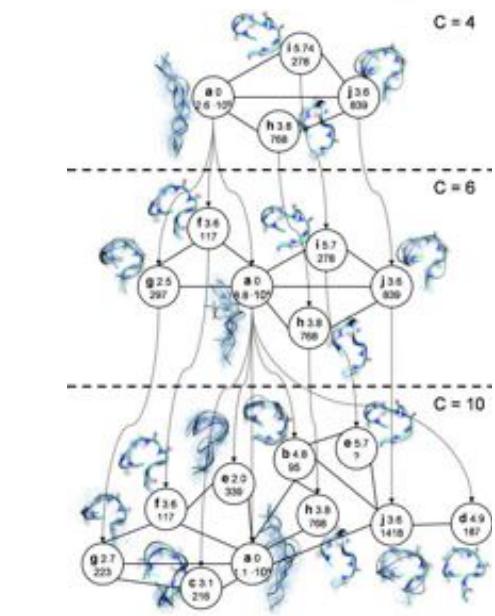
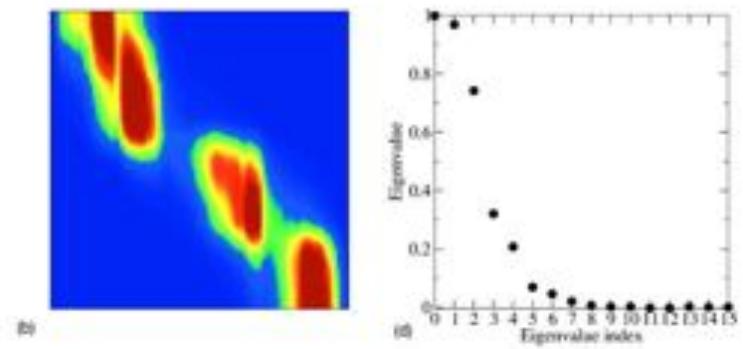
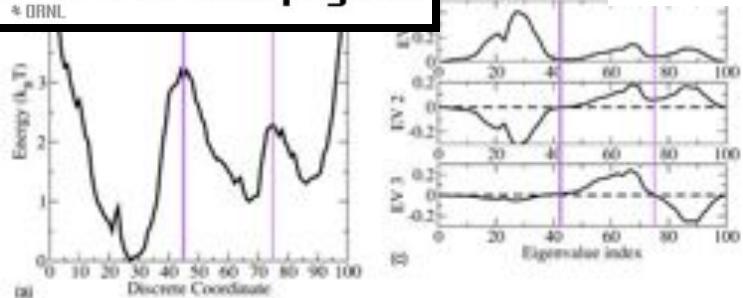
$10^{10}$  atoms  
= Living Cell

Human Embryonic Stem Cell

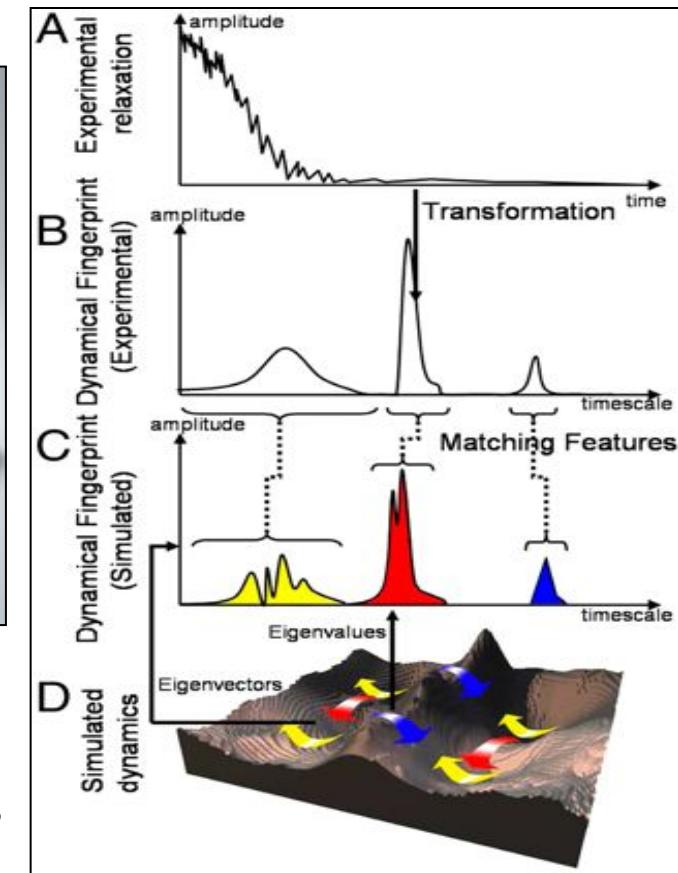
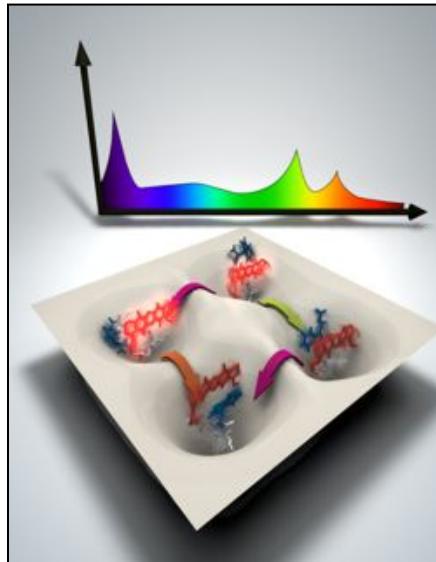
**But...**

**Microsecond Timescale Limitation!**

**New Concepts Needed....**



# Exascale Concepts



Dynamical  
Fingerprints

JCP 126 840 (2007); 134 244108 (2011); PNAS 108 4822 (2011)



### Co-workers

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Sally Ellingson

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Alexei Sokolov (ORNL)  
Marcus Foston,  
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NIH Translational Medicine  
DFG  
DOE INCITE.



**Roland  
Schulz**

